## FROM PATHWAYS TO PEOPLE: MODELLING ALLERGIC CONTACT DERMATITIS

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UNILEVER R&D



#### **ALLERGIC CONTACT DERMATITIS**

Sensitization



1. Skin penetration and haptenation: covalent modification of skin protein

2. Migration of Langerhans cells and dermal dendritic cells

3. Antigen processing and presentation by dendritic cells

> 4. Presentation of haptenated peptide by dendritic cell to T cells

Efferent

Vessel

Lymphatic

Lymph Node

5. Proliferation and differentiation of specific T cells

Thoracic Duct

6. Generation of antigen-specific memory T cell population

**Epidermis** 

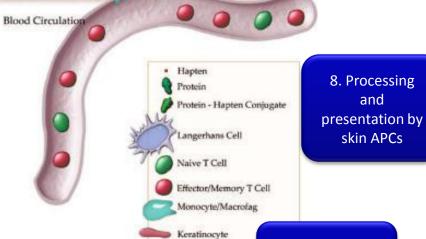
Dermis

9. Recruitment of antigenspecific memory T cells and expansion of effector T cells to elicit response

8. Processing

and

skin APCs



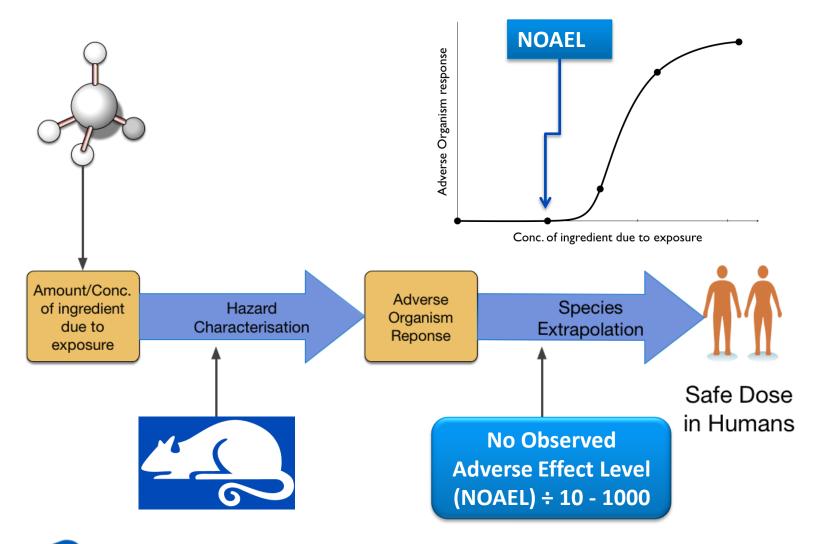
Elicitation

7. Re-exposure to chemical

Image from: Karlberg et al. Chem. Res. Toxicol. (2008), 21, 53-69.

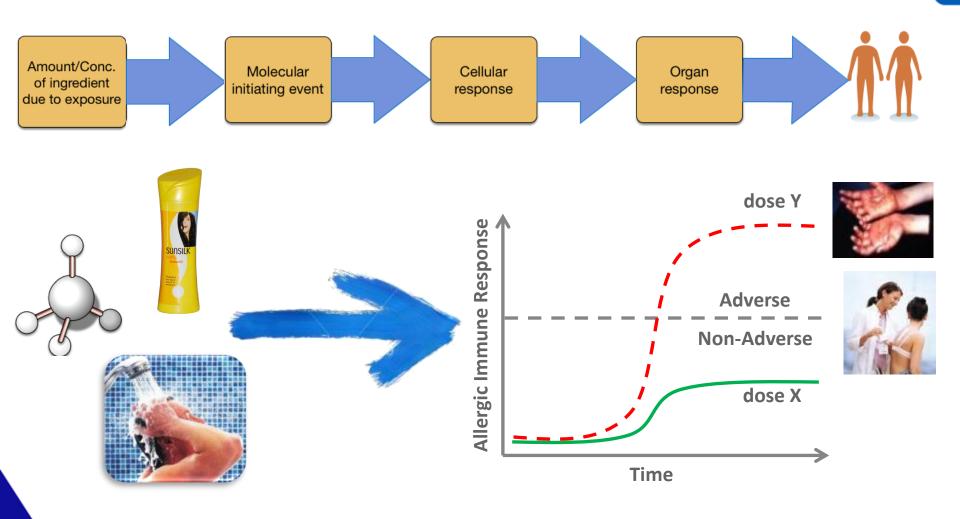
## CURRENT HUMAN HEALTH RISK ASSESSMENT PARADIGM FOR CHEMICAL INGREDIENTS





## NEW HUMAN HEALTH RISK ASSESSMENT PARADIGM FOR SENSITISING INGREDIENTS?





#### **NEW HUMAN HEALTH RISK ASSESSMENT** PARADIGM FOR SENSITISING INGREDIENTS?



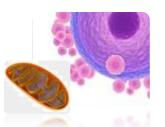


1. Skin Penetration

2. Electrophilic substance: directly or via auto-oxidation or metabolism



3-4. Haptenation: covalent modification of epidermal proteins



5-6. Activation of epidermal keratinocytes & Dendritic cells



7. Presentation of haptenated protein by Dendritic cell resulting in activation & proliferation of specific T cells

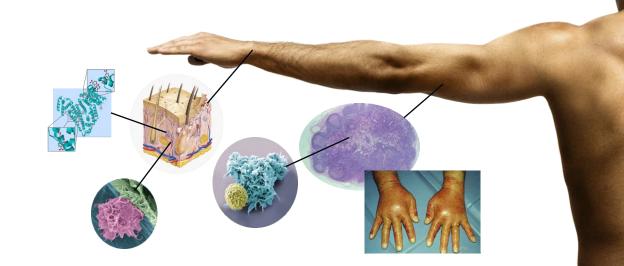


8-11. Allergic Contact **Dermatitis: Epidermal** inflammation following re-exposure to substance due to T cell-mediated cell death



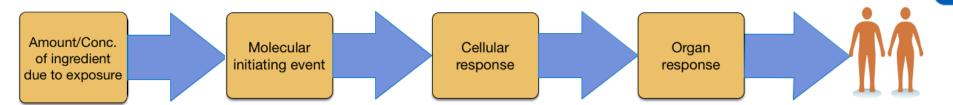


Modified from 'Adverse Outcome Pathway (AOP) for Skin Sensitisation', OECD

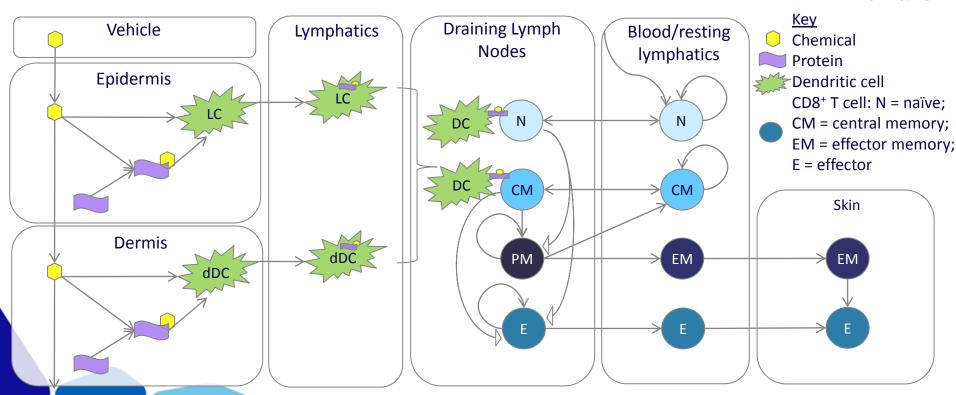


# DEVELOP A MATHEMATICAL MODEL OF ALLERGIC CONTACT DERMATITIS TO ENABLE RISK ASSESSMENT DECISION-MAKING FOR NEW CHEMICALS





### Safe Dose in Humans



## **KEY ASSUMPTION: ANTIGEN DRIVING T CELL RESPONSE IS HAPTENATED PEPTIDE**



#### **Direct Acting**

- haptenated residues present on pMHC initiating the response

&/or

#### **Altered Processing**

- haptenated residues disrupt normal proteassome processing resulting in presentation of altered self-peptides

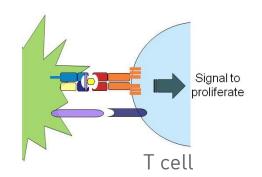
&/or

#### **Altered Selection**

- hapten activity disrupts MHC loading resulting in altered

Dendritic cell

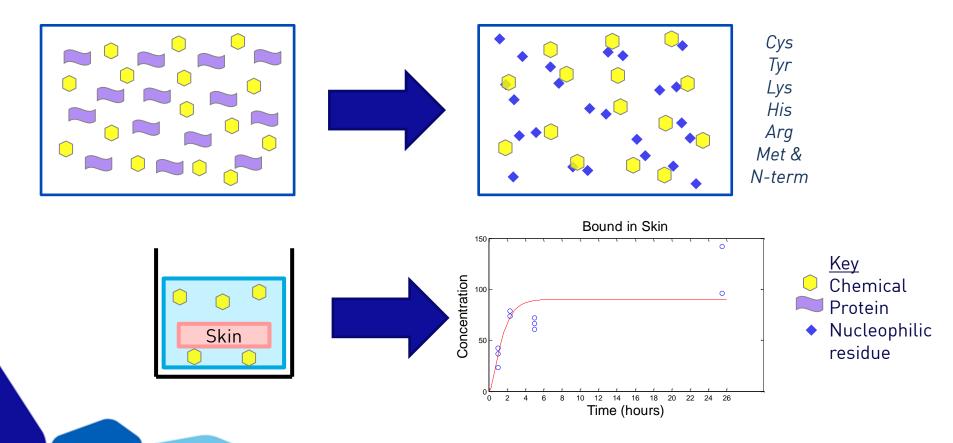
selection of self



## PREDICTING HAPTENATION RATE OF SKIN PROTEIN BY DI-NITROCHLOROBENZENE (DNCB)

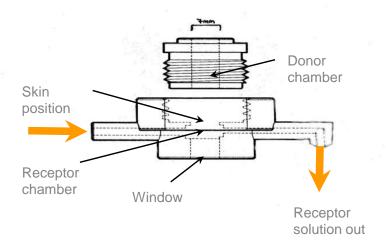


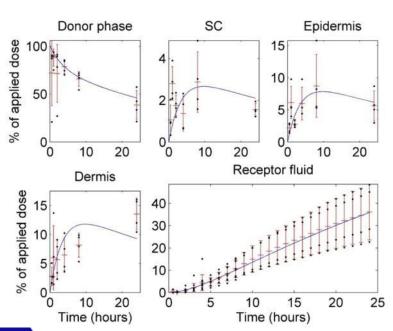
- Modelling approach treat proteins as mixture of nucleophilic residues
- Use experimental data to determine 'bulk' haptenation rate & estimate the fraction of nucleophiles we expect to be haptenated

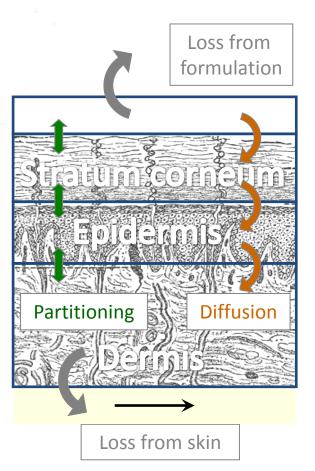


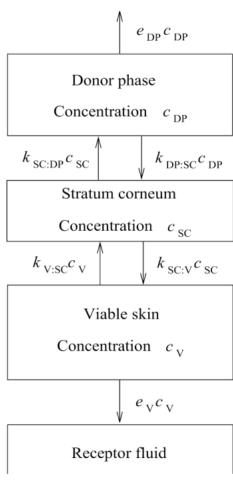
#### **MODELLING SKIN BIOAVAILABILITY OF CHEMICAL**







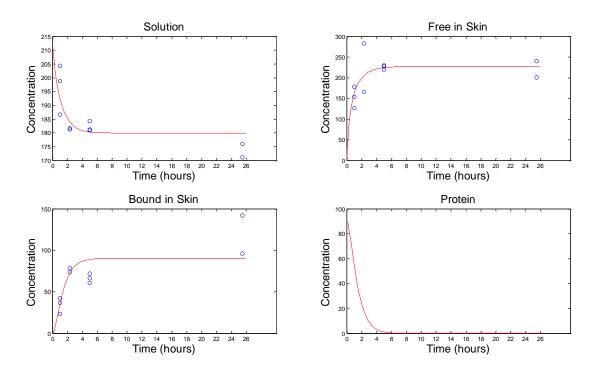


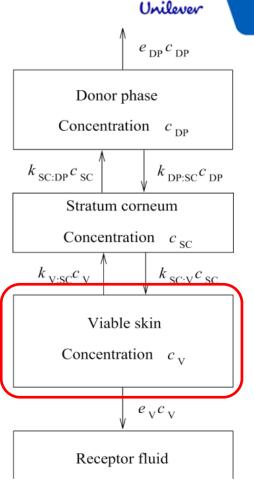


## PREDICTING EXTENT OF SKIN PROTEIN HAPTENATION FOLLOWING SINGLE EXPOSURE TO DNCB

Skin bioavailability model expanded to include covalent modification of skin protein by chemical

» Amount of haptenated protein predicted over time

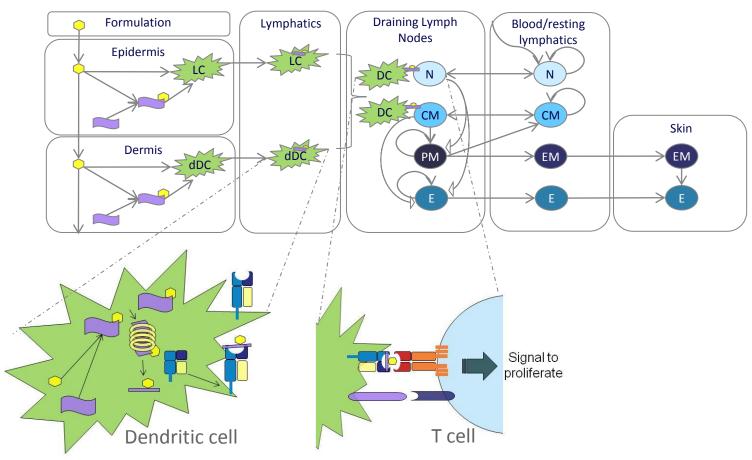




» Haptenated protein and free chemical concentrations are inputs to immune response model

## TRANSLATING CHEMICAL SENSITISER EXPOSURE INTO EXTENT OF HAPTEN PRESENTATION



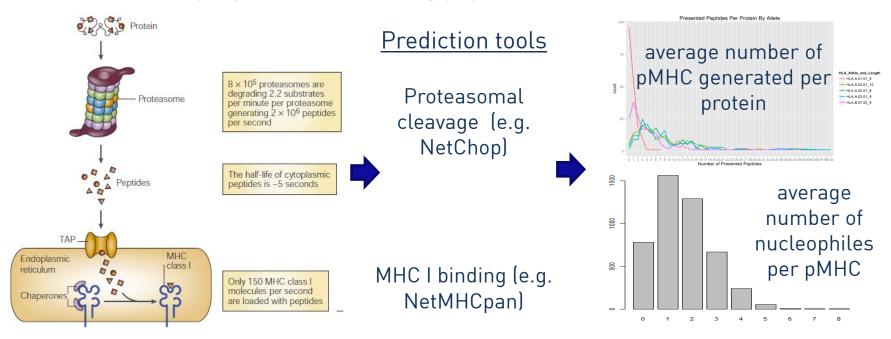


- Intracellular LC/DC protein is haptenated by free chemical
- Proteasomal processing and Class I MHC presentation
- DC-T cell synapse in draining lymph node

## MODELLING PROTEASOMAL PROCESSING & CLASS I MHC ANTIGEN PRESENTATION



Assume 'Direct Acting' hypothesis (unaltered proteasomal processing) and determine properties of resulting peptides



Estimate average pMHC surface density from considerations of:

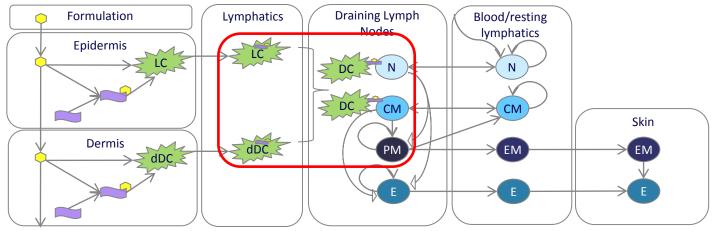
- 1. the fraction of nucleophiles we expect to be haptenated
- 2. probability that a pMHC contains a haptenated nucleophile

ILLUSTRATION FROM YEWDELL, J.W., E. REITS, AND J. NEEFJES. (2003). Making sense of mass destruction: quantitating MHC class I antigen presentation. *Nat. Rev. Immunol. 3*, 952–61.

VITA, R, L. ZAREBSKI, J.A. GREENBAUM, ET AL. (2010). The immune epitope database 2.0. Nucleic Acids Res. 38, D854–62.

## MODELLING DC-T CELL INTERACTIONS IN DRAINING LYMPH NODE



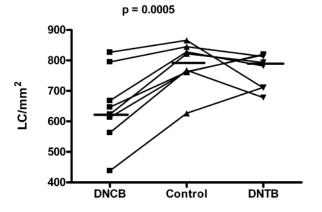


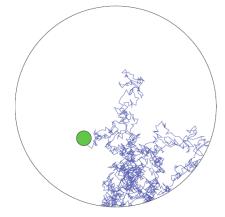
 LC/dDC migrate from sensitiser-exposed skin to present haptenated peptides via Class I MHC to CD8<sup>+</sup> T cell in draining lymph node

e.g. Pickard et al, 2009

DC/T cell movement in lymph node is described by random walk

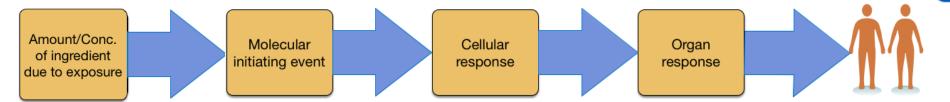
e.g. Day & Lythe, 2017



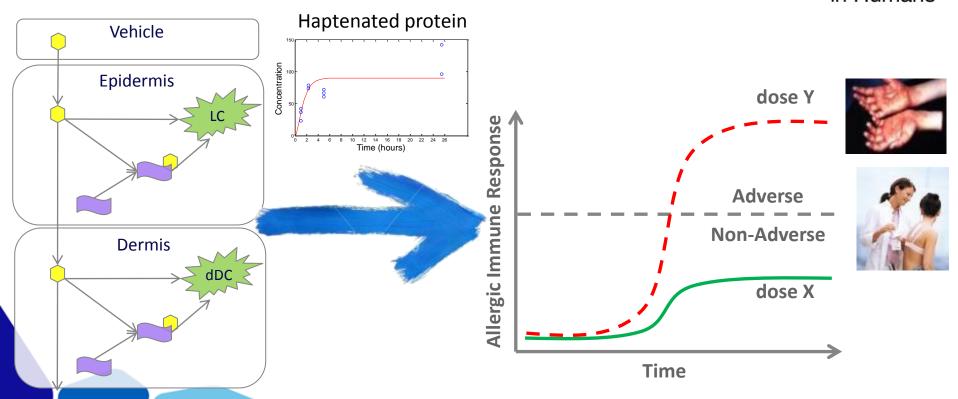


# DEVELOP A MATHEMATICAL MODEL OF ALLERGIC CONTACT DERMATITIS TO ENABLE RISK ASSESSMENT DECISION-MAKING FOR NEW CHEMICALS





Safe Dose in Humans



#### 'T LYMPHOCYTES: ORCHESTRATORS OF SKIN SENSITISATION' WORKSHOP – MAY 2010, LONDON

Number of T lymphocytes

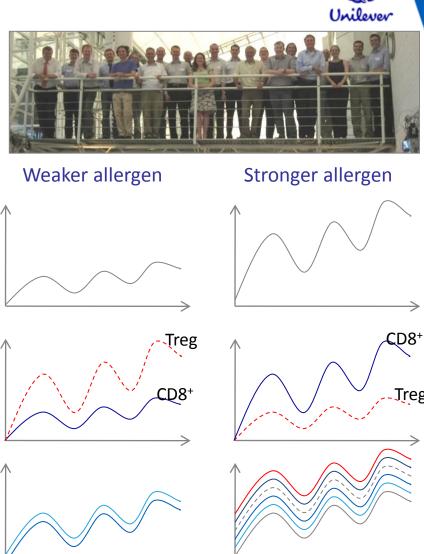


Immunologists, risk assessors & mathematical modellers – 2 day workshop

What are the characteristics of the T cell response that could reflect sensitiser potency in humans?

- » Magnitude: What is the extent of sensitiser-induced T cell response (volume, kinetics & duration)?
- » Quality: Within sensitiser-induced T cell response, what is the balance between the T cell sub-populations?
- » Breadth: What proportion of the T cell clonal repertoire has been stimulated by a given sensitiser?

Kimber et al. 2012. Toxicology. 291. 18-24



Time

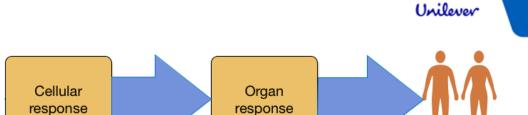
#### CD8<sup>+</sup> T CELL RESPONSE: INITIAL MODEL SCOPE

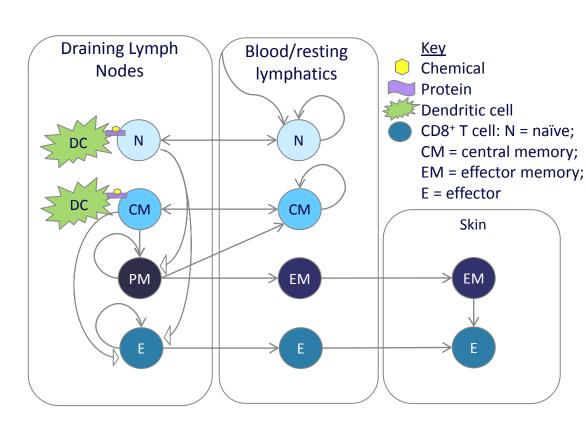
Current model scope models the antigen-specific CD8<sup>+</sup> T cell response including:

- » naïve (N) CD45RO<sup>-ve</sup>CD62L<sup>+ve</sup> or CD45RA<sup>+ve</sup>CD27<sup>+ve</sup>
- » central memory (CM) -CD45RO<sup>+ve</sup>CD62L<sup>+ve</sup> or CD45RA<sup>-ve</sup>CD27<sup>+ve</sup>
- » effector memory (EM) -CD45RO+veCD62L-ve or CD45RA-veCD27-ve
- » effector (E) CD45RO<sup>-ve</sup>CD62L<sup>-</sup>
  ve or CD45RA<sup>+ve</sup>CD27<sup>-ve</sup>

Human sensitiser-specific T cell data is largely unavailable:

- » Make use of literature data
- » Generate sensitiser-specific, human-relevant data



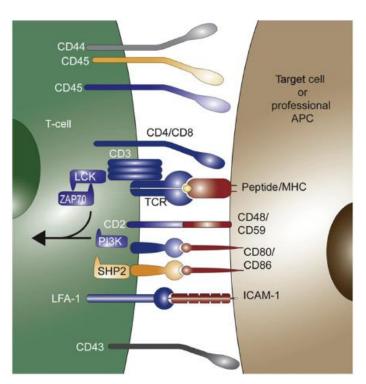


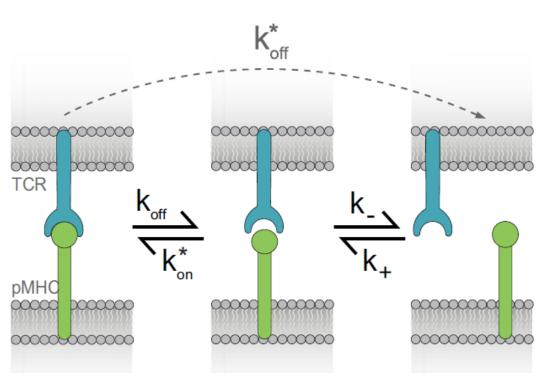
#### PREDICTING THRESHOLD FOR T CELL ACTIVATION



Is the nature (TCR affinity) of the antigen limiting?

what k<sub>on</sub>/k<sub>off</sub> do TCRs have for cognate hapten pMHC





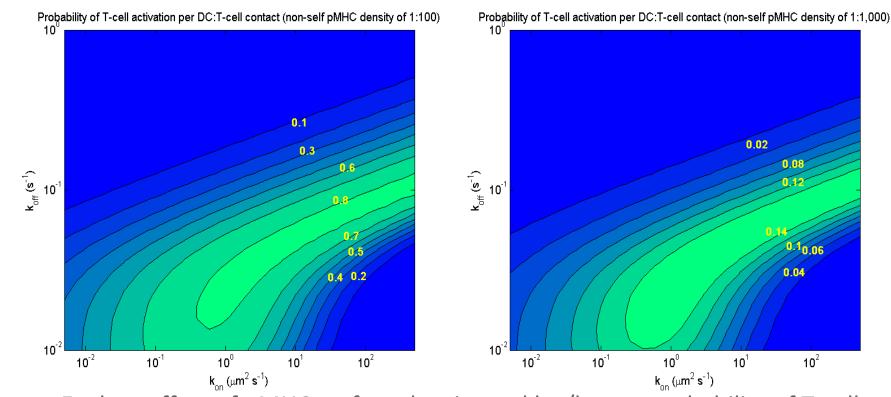
Explore effect of pMHC surface density and  $k_{on}/k_{off}$  on probability of T-cell triggering with the available models (Zarnitsyna & Zhu, 2012). Simulations generated using 'confinement time' model of Dushek, et al, 2009.

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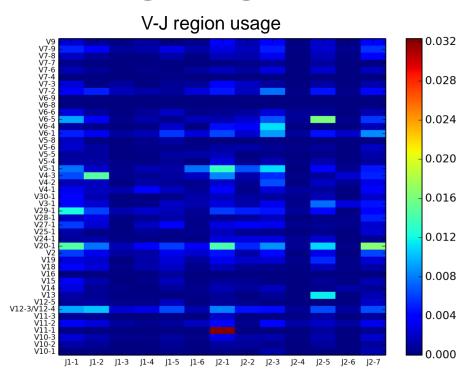


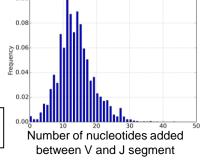
## Molecular basis of T cell recognition: how do TcRs interact with sensitising antigens?

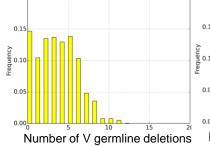


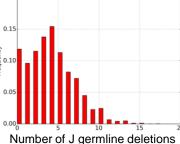
- Thermodynamic and kinetic parameters
- Role of MHC
- Characteristics of the CDR3s, and framework
- Using DeCombinatoR:
   (//github.com/uclinfectioni
   mmunity/Decombinator) to
   assign TcR sequences V
   region usage, J region
   usage, no. of V deletions,
   no. of J deletions, CDR3
   sequence read

Benny Chain & Theres Matjeka









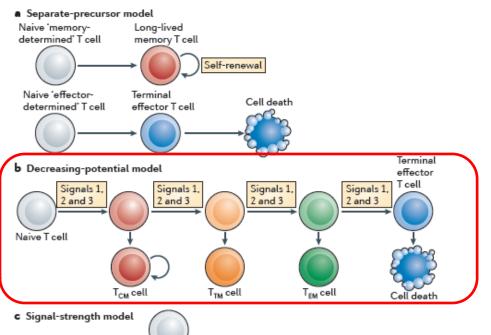
## CD8+ T CELL DIFFERENTIATION: COMPARING CURRENT HYPOTHESES

Increasing

strength of signals 1, 2 and 3

Terminal effector T cell





- Experiments tracking T cell fates have generated a range of hypotheses on T cell differentiation
- Need to select a differentiation mechanism despite uncertainty to predict the number of CD8<sup>+</sup> memory T cells following sensitizer exposure
- Currently building CD8<sup>+</sup> T cell models based upon both decreasing-potential (Leeds) & asymmetric-division (Unilever) to explore the impact of each mechanism on predicted T cell response

T<sub>CM</sub> cell
T<sub>TM</sub> cell
T<sub>EM</sub> cell
Cell death

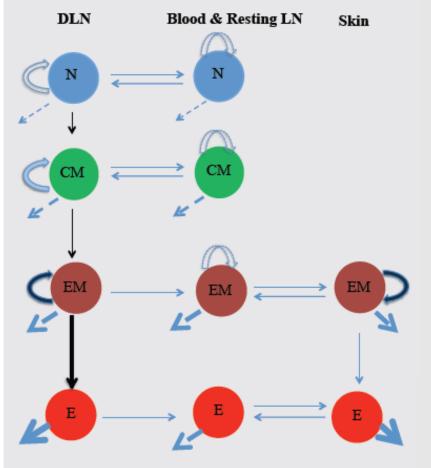
APC
Greater effector
T cell potential

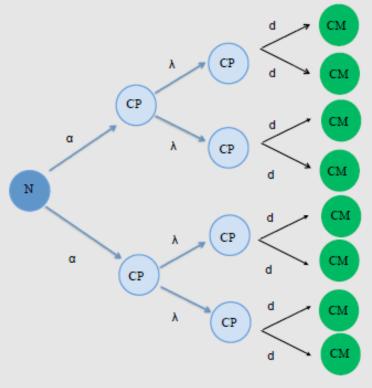
Greater memory
T cell potential

**UNIVERSITY OF LEEDS** 

Image from: Kaech and Cui, Nat. Rev. Immunol. (2012), 12, 749-761

#### CD8<sup>+</sup> T cell mathematical model





- $\blacksquare$   $\alpha$  rate of contact between naive T cells and APCs in the lymph node.
- lacksquare  $\lambda$  rate of proliferation during the clonal expansion.
- $\blacksquare$  d rate of differentiation.

#### Heterogeneity: decreasing potential model



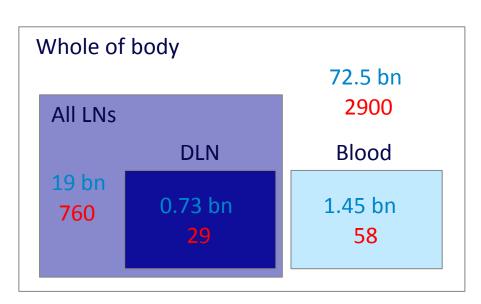


#### STARTING T CELL POPULATION SIZE



- » Assume no antigen specific effector or memory CD8<sup>+</sup> T cells at the start in an unexposed individual
- Estimate number of naïve antigen specific CD8<sup>+</sup> T cells in DLN
   blood
- » Assume exposure to skin on the arm
  - » 25 draining lymph nodes (DLN) in axilla out of 650 in total
  - » Consider a single TCR
  - » One in 25 million naïve T cells are antigen specific

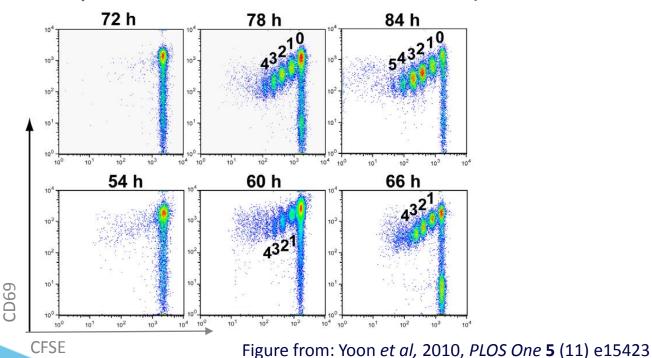
All TCRs
Ag specific (1 TCR)



#### MODELLING PROGRAMMED T CELL PROLIFERATION

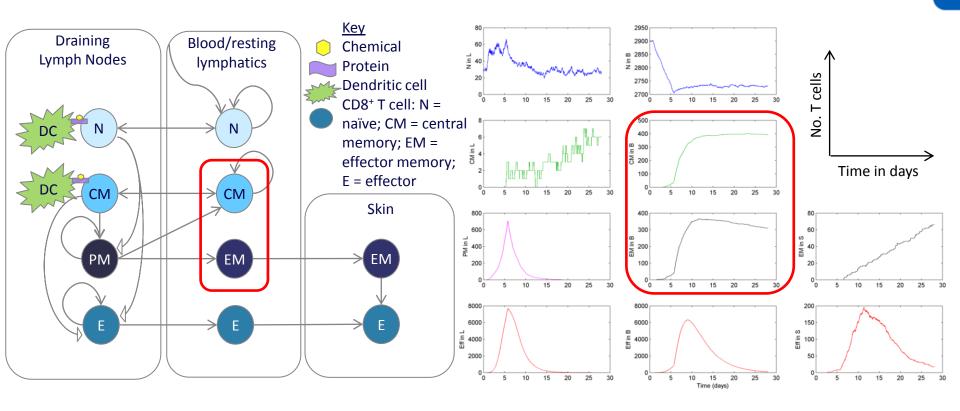


- Following activation, CD8+ T cell proliferation continues independently of further antigenic stimulation
- Going through 7-19 generations (Kaech & Ahmed, 2001; Badovinac et al, 2007) to develop effector and memory populations
- No human data available for proliferation rates
- Obtain proliferation rates from mouse models (e.g. Yoon *et al,* 2010: draining lymph node response to influenza virus infection)



## CD8<sup>+</sup> T CELL MODEL PREDICTIONS: 5 DAY ANTIGEN EXPOSURE IN LYMPH NODE, 1X MODEL ITERATION

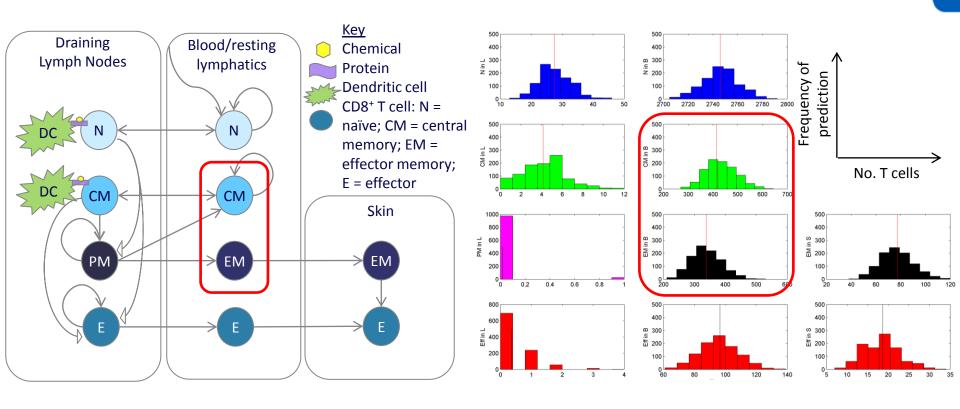




- Combine the parameters and processes together
- Simulate single exposure to chemical and track response for one month

## CD8<sup>+</sup> T CELL MODEL PREDICTIONS: 5 DAY ANTIGEN EXPOSURE IN LYMPH NODE, 1000X MODEL ITERATIONS





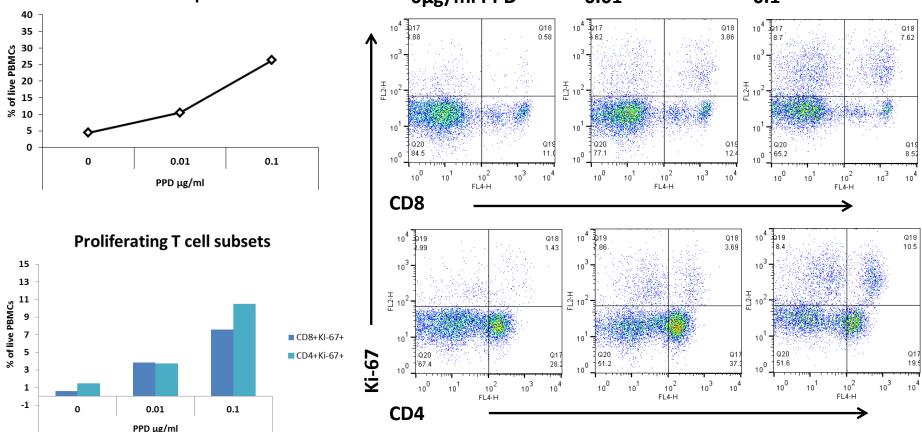
- Combine the parameters and processes together
- Simulate single exposure to chemical and track response for one month

#### Characterising human T lymphocyte responses to chemical allergen p-phenylenediamine (PPD)







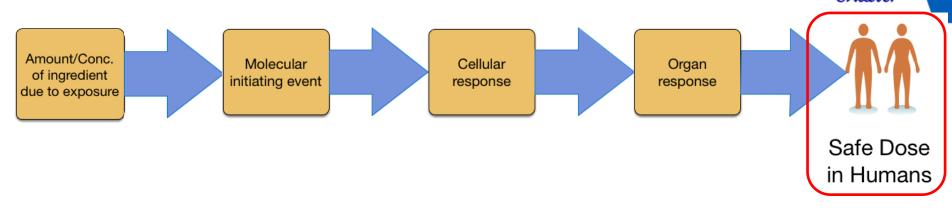


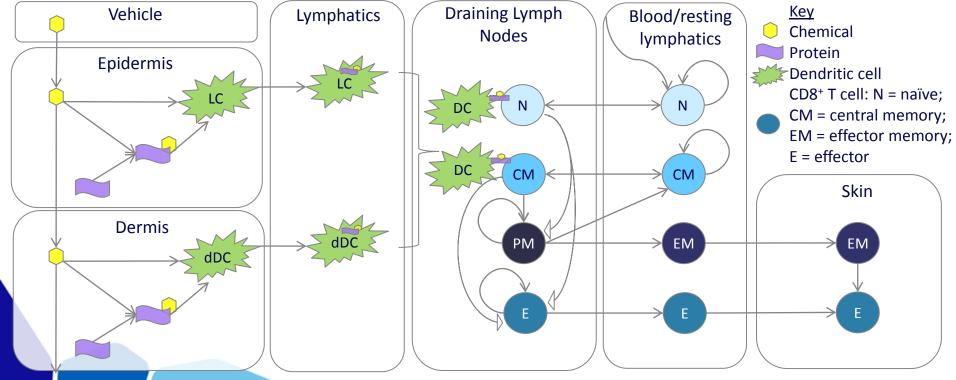
Allergen driven proliferation of total lymphocytes and individual T cell subsets measured by intracellular Ki-67 expression.

Rebecca Dearman, Amy Popple, Ian Kimber & Jason Williams

# DEVELOP A MATHEMATICAL MODEL OF ALLERGIC CONTACT DERMATITIS TO ENABLE RISK ASSESSMENT DECISION-MAKING FOR NEW CHEMICALS







## PATHWAYS-BASED RISK ASSESSMENT FOR SKIN SENSITISATION: APPLICATION OF MATHEMATICAL MODELLING

Unilever

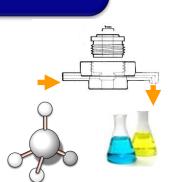
1. Skin Penetration

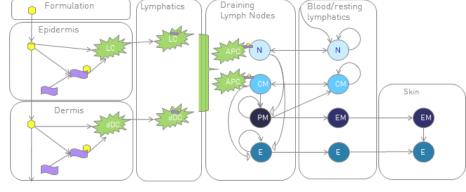
2.Electrophilic substance: directly or via auto-oxidation or metabolism 3-4. Haptenation:
covalent
modification of
epidermal proteins

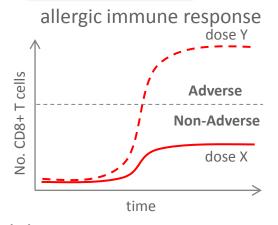
5-6. Activation of epidermal keratinocytes & Dendritic cells 7. Presentation of haptenated protein by Dendritic cell resulting in activation & proliferation of specific T cells

8-11. Allergic Contact
Dermatitis: Epidermal
inflammation following
re-exposure to substance
due to T cell-mediated
cell death







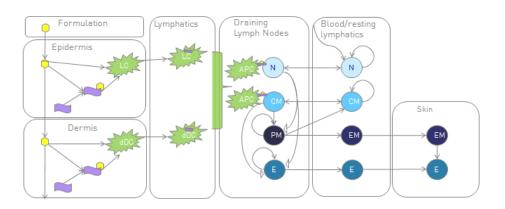


- 1. Generate skin bioavailability & haptenation data as model input parameters
- 2. Use linked mathematical models to predict human allergic immune response
- 3. Apply human immune response model prediction for risk assessment decision
- 4. If exposure predicted to be non-adverse, verify prediction using clinical data

#### **NEXT STEPS: CHALLENGES AHEAD**



- Broadening current model scope to include:
  - CD4<sup>+</sup> T helper & regulatory T cell responses
  - sensitiser-induced inflammation in skin induction & elicitation
  - impact of varying frequency & surface area of sensitiser exposure
  - impact of varying formulation (vehicle)
- Using experimental & clinical data to inform & benchmark initial model predictions



#### **ACKNOWLEDGEMENTS**





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Rebecca Dearman, Amy Popple & Ian Kimber





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Jason Williams



#### University College London

Benny Chain & Theres Matjeka

